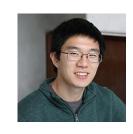
# Late Fusion with Triplet Margin Objective for Multimodal Ideology Prediction and Analysis









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# Political Ideology

### Biden Outlines 'Safer America Plan'

From the Left	From the Center	From the Right
Biden defends FBI, promotes ban on assault-style weapons	Biden talks crime, gun control during Pennsylvania speech	Biden Says The Military Can Obliterate The Second Amendment
Associated Press	NewsNation	The Daily Caller
	President Joe Biden traveled to Wilkes-Barre on Tuesday to deliver remarks on his Safer America Plan, and specifically gun safety in <b>tory Article Comparison for Ideology</b> Chang, David Wegsman, Nicholas Beauch high-capacity magazines and ghost guns; requires background checks for all gun sales with some exceptions; clears court backlogs and improves pretrial supervision of criminal cases; and invests in recruiting and training 100,000 additional police officers for community	
opposed to defunding the police; I'm also opposed to defunding the	policing over the next five years. He also forcefully defended the FBI as the agency and its employees have come under	Scalia. "As one of the most – one of the most conservative justices in history, Justice

agency and its employees have come under increased criticism and threats of violence...

# Multimodal Ideology Prediction

## Biden Outlines 'Safer America Plan'

### From the Left

## Biden defends FBI, promotes ban on assault-style weapons

Associated Press

See rating details

President Joe Biden on Tuesday forcefully defended the FBI as the agency and its employees have come under withering criticism



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#### From the Center

### Biden talks crime, gun control during Pennsylvania speech

NewsNation LLCRR

See rating details

President Joe Biden traveled to Wilkes-Barre on Tuesday to deliver remarks on his Safer America Plan, and specifically gun safety in America.



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### From the Right

### Biden Says The Military Can Obliterate The Second Amendment

The Daily Caller 🔲 🗆 🗆 🦳 🦳

See rating details

President Joe Biden said Tuesday while in Pennsylvania that "brave right wing Americans" who claim the Second Amendment is meant to fight back against a tyrannical government



Scalia.

"As one of the most – one of the most conservative justices in history, Justice...

## Dataset and Models

- 5 new multimodal datasets from
  - 11 US news sources across the political spectrum
  - Reddit posts from political subreddits
  - Twitter tweets from politicians
- Multimodal models
  - Early fusion and late fusion
- Continued pretraining objectives
  - New ideology-driven triplet margin objective

